Applications of the ADIFOR 3.0 Automatic Adjoint Generation Tool at the NASA Langley Research Center

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Objectives

- Apply <u>Automatic Differentiation of Fortran (ADIFOR)</u>, version 3.0, to codes of interest for NASA
- Demonstrate ADIFOR 3.0 automatic adjoint generation capability in:
 - Aerodynamic Sensitivity Analysis (wing grid generation + computational fluid dynamics)
 - Aerodynamic Shape Optimization (Aerodynamic Sensitivity
 Analysis + gradient-based optimization)
 - Aerodynamic Control Effectiveness Analysis

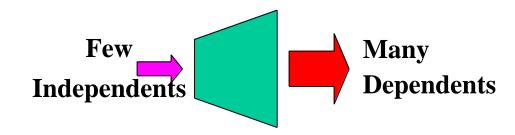
Acknowledgements

Alan Carle and Mike Fagan of Rice University
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ADIFOR 3.0 from Rice University

- Forward mode (ADIFOR)
- Chain rule of calculus
- Forward propagation of derivatives through the code
- independent variables
- Forward mode second derivatives

- Reverse Mode ("ADJIFOR")
- Discrete adjoint formulation
- Backward propagation of adjoints through the code
- Best for more dependent than Best for more independent than dependent variables



Many Dependents **Independents**

AIAA Paper 94-2197

AIAA Paper 99-3136

AIAA Paper 98-4807

AIAA Paper 99-3136

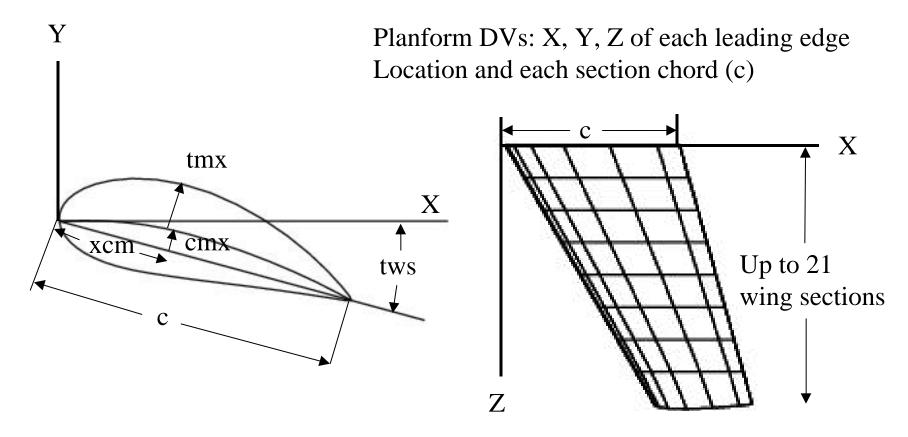
Aerodynamic Sensitivity Analysis Geometry and Grid Generation

- Simple Fortran wing geometry and grid generation code (MYGRID) created for ADIFOR studies
 - Swept, tapered transport-like wing planforms
 - NACA four digit airfoil series wing sections
 - Single-block grids generated; split for parallel flow solver execution
 - Grid quality was low in consideration
 - Many shape design variables (DV) desired for adjoint studies
- ADIFOR 3.0 generated MYGRID.ADJ code computes <u>exact</u> surface and volume grid adjoints

Aerodynamic Sensitivity Analysis Computational Fluid Dynamics (CFD)

- CFL3D code by Thomas, Rumsey, and Biedron of NASA LaRC
 - Iteration required to solve the Euler / Navier-Stokes flow equations in conservation form
 - Numerous grid, solver, and convergence acceleration options
 - Sequential and parallel code versions used
- ADIFOR 3.0 generated CFL3D.ADJ code computes the <u>exact</u> lift-to-drag ratio (wing efficiency) adjoint
 - Initial differentiation excluded the viscous flow modeling routines
 - Automatically generated code required enormous disk storage (33GB)
- The manually implemented Iterated Reverse Mode (IRM) reduces disk storage by saving only the converged "steady-state" solution information

Aerodynamic Sensitivity Analysis Wing Design Variables (DVs) Definition



Section DVs: maximum thickness (tmx), maximum camber (cmx), x-location of maximum camber (xcm), and twist angle (tws) for each section

Aerodynamic Sensitivity Analysis Demonstrational Problem

- Volume grid sizes: 425, 2673, 18785, and 276705 points
- Point-matched wing grids
- Steady, inviscid, transonic flow around 3-D wing
- One output function (the wing lift-to-drag ratio)
- Up to 168 independent variables (wing shape parameters)

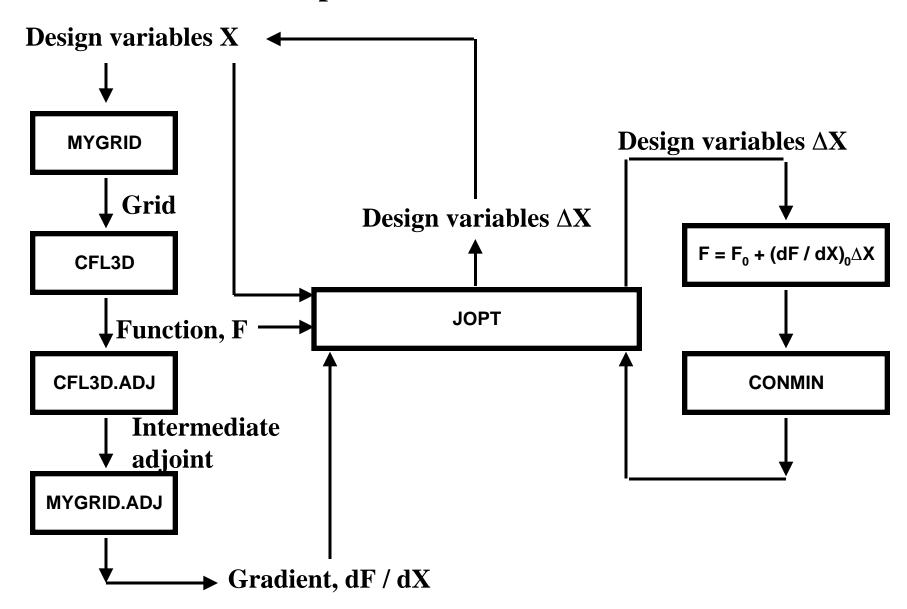
Target Problem

- Volume grid sizes: 400,000 (inviscid wing)
- Patched and overset grids
- Time dependent viscous flow around 3-D aircraft configuration
- Multiple output functions (objective + flow-dependent constraints)
- Up to 500 independent variables (aircraft shape parameters)

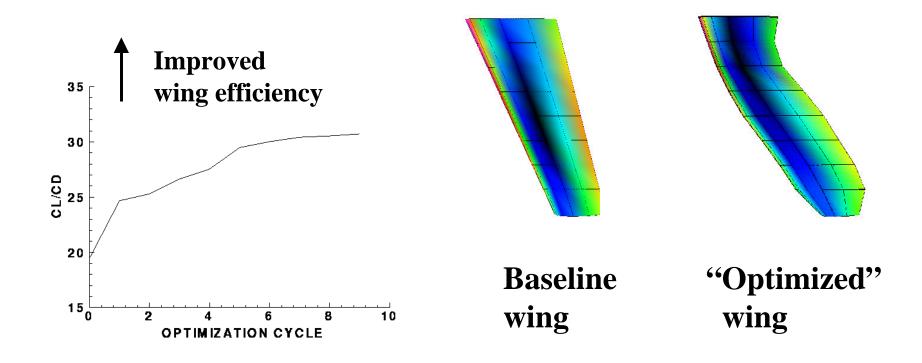
Aerodynamic Shape Optimization Gradient-Based Optimization

- JOPT = CONMIN + first-order Taylor series approximation to the nonlinear optimization problem, based upon function and gradient
- Optimization objective minimize -(CL / CD), or maximize (CL / CD)
- Up to 168 design variables (8 DV per section, 21 wing sections)
- DV bounds and optimization move limits imposed
- Unconstrained optimizations and geometry / grid generation executed on workstation
- Aerodynamic function and gradient execution on up to 33 processors of a NASA Ames SGI Origin 2000

Aerodynamic Shape Optimization Optimization Flowchart



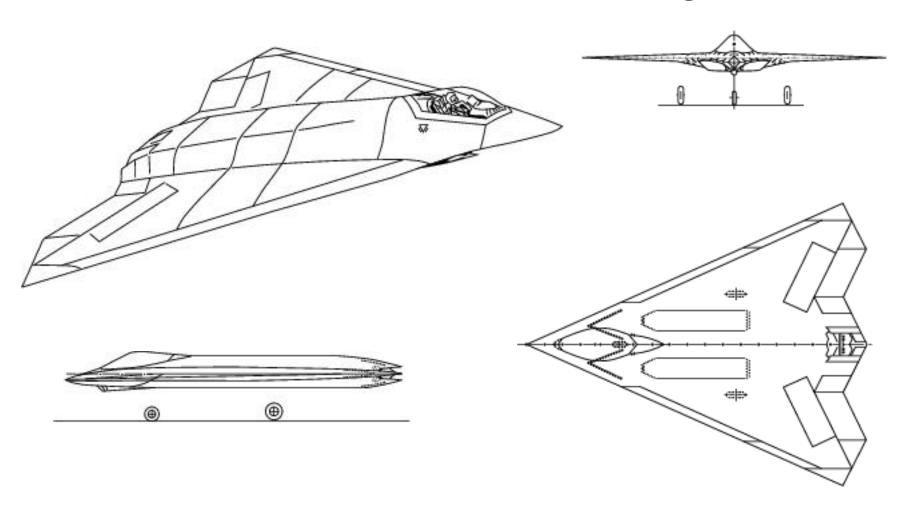
Aerodynamic Shape Optimization Planform and Thickness Optimization Results M = 0.84, $\alpha = 3.06$ degrees, 276705 grid points, 21 wing sections, 9 optimization cycles



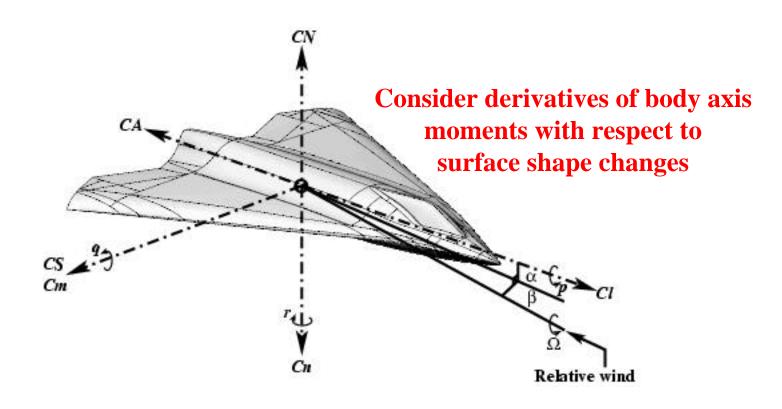
Aerodynamic Control Effectiveness Analysis Computational Fluid Dynamics (CFD)

- PMARC code from NASA Ames Research Center
 - Iteration required to solve potential flow equations
 - Inviscid, irrotational, and incompressible flow
 - Boundary layer and compressible flow corrections available; not used
 - Full 3-D aircraft configuration modeled
- ADIFOR 3.0 generated PMARC.ADJ code computes the <u>exact</u> adjoints of three body axis moments with respect to thousands of discrete surface shape changes
- "Black-box" automatic adjoint code generation
 - New ADIFOR 3.0 user trained and generating code within days
 - Execution through entire iteration process
 - No IRM techniques employed
 - Manageably large disk file generated

Aerodynamic Control Effectiveness Analysis Lockheed-Martin Tactical Aircraft Systems Innovative Control Effectors (ICE) Configuration

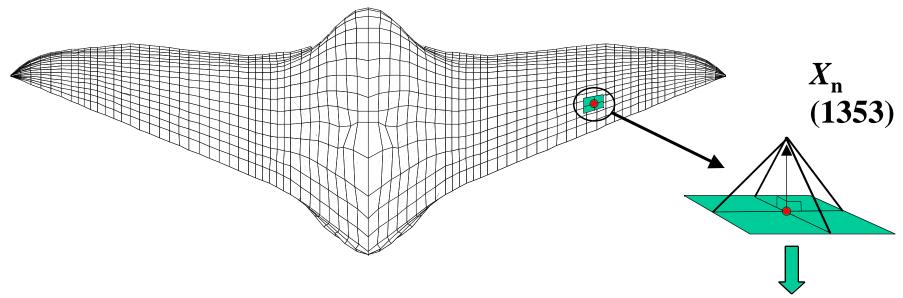


Aerodynamic Control Effectiveness Analysis Lockheed-Martin Tactical Aircraft Systems Innovative Control Effectors (ICE) Configuration



AIAA Paper 99-3136 discusses derivatives of forces and moments with respect to angle of attack (α) and angle of sideslip (β)

Aerodynamic Control Effectiveness Analysis Derivative Definition



Sensitivities

- Derivatives of pitch, roll, and yaw moment coefficients with respect to a displacement of 1353 discrete surface grid points normal to the surface

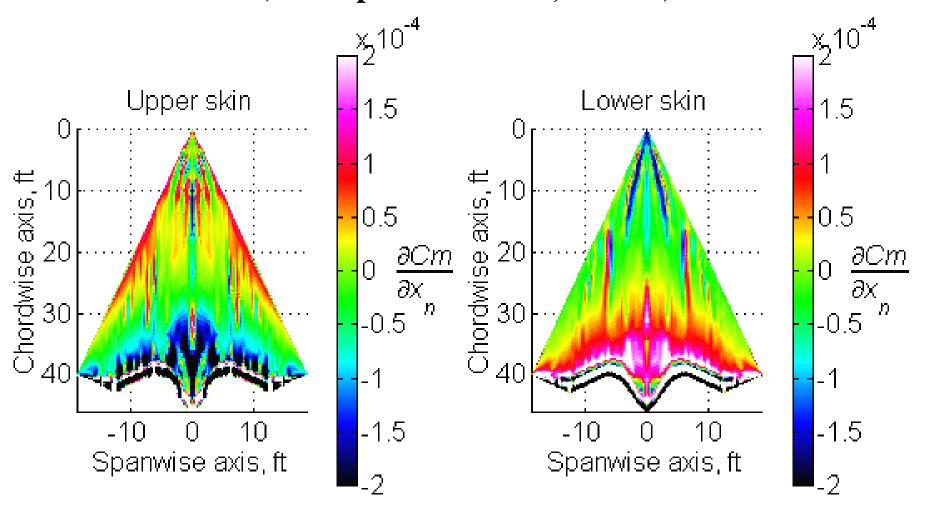
 Coarse resolution surface grid sensitivities interpolated over the configuration for plotting

$$dC_{\mathbf{m}}/dX_{\mathbf{n}}$$

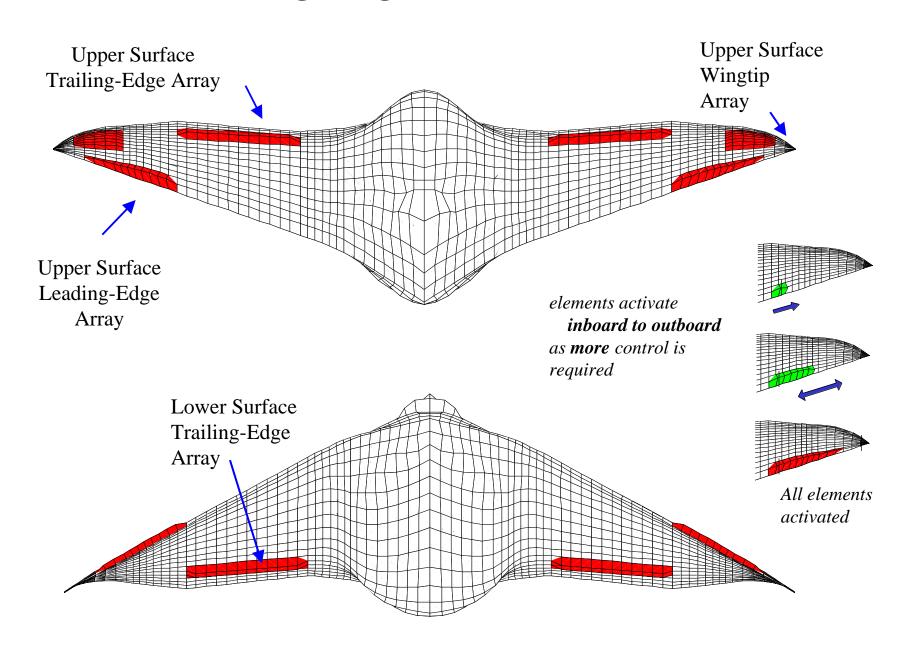
$$\mathrm{d}C_{\mathbf{l}}/\mathrm{d}X_{\mathbf{n}}$$

$$\mathrm{d}C_{\mathbf{l}}/\mathrm{d}X_{\mathrm{n}}$$
 $\mathrm{d}C_{\mathbf{n}}/\mathrm{d}X_{\mathrm{n}}$

Aerodynamic Control Effectiveness Analysis Pitch Control Effectiveness Sensitivity Contours (Incompressible Flow, α =4.39)



Aerodynamic Control Effectiveness Analysis Most Promising Designs (Used in Control Law Simulation)



Concluding Remarks

- ADIFOR 3.0 automatically generated adjoint code has been used in aerodynamic sensitivity analyses, aerodynamic shape optimization, and a control effectiveness analysis at NASA LaRC
- ADIFOR 3.0 generated CFL3D.ADJ adjoint code requires the execution time of about 6 to 20 function evaluations
- The Iterated Reverse Mode (IRM) technique significantly reduces the computer disk storage of adjoint code for iterative solutions
- ADIFOR 3.0 generated CFL3D.ADJ adjoint code only requires about Kbytes of RAM and about 32 Kbytes disk per grid point; enables target problem to be solved on moderate parallel computer
- Use of ADIFOR 3.0 generated adjoint sensitivities enabled the development of an interactive control selection and evaluation tool